# SKEWING THE ODDS <br> <br> TAKING RISKS FOR RANK-BASED REWARDS 

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## RISK TAKING IN RANK-BASED COMPETITION: IT'S IMPORTANT

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- Optimal Bayesian persuasion (Meyer, 1991), (Kamenica and Gentzkow, 2011)
- policy level, in a world where agents are motivated by rank-based incentives, contest risk taking has significant social externalities:
- The social externalities generated by contestant risk taking are context specific
- But contestant risk-taking itself simply depends on rank-based rewards
- So a general theory of rank-based risk taking can be applied in specific contexts to mitigate externalities


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## THIS PAPER

- Develops a theory of risk taking in rank-based competitions with
- An arbitrary (finite) number of contestants,
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## GENERALITY IS IMPORTANT

- Contests with multiple contestants, varying reward levels, and endogenous choice of risk distributions induce fundamentally different equilibrium behavior than "simpler" contests
- Most rules for allocating rank-based rewards proposed in economics literature (e.g., Ziph's law, PAM models) entail non-binary reward structures.
- Differences between the solution of random contest games and other games (e.g., all pay auctions) are obscured if attention is restricted to two-player models.


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## Endogenous performance distributions matter

- For a very large class of rank-based prize allocation systems, which includes the power law, Gilbrat's law, winner-take all, convex, and concave allocations,
- equilibrium performance distributions never satisfy the symmetry and unimodality restrictions imposed by parametric models of risk taking. (e.g., (Klette and Meza, 1986), (Hvide, 2002), (Gaba, Tsetlin and Winkler, 2004), (Goel and Thakor, 2008), and (Kräkel, 2008))


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## EXECUTIVE SUMMARY OF RESULTS

- Optimal contest strategies are always bounded.
- The upper bound is increasing in the ratio between the reward for the highest performance level and the fair share division of rewards.
- The modality of the performance distribution denends on the sign pattern of the second differences of the rank-ordered rewards.
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## Risk taking with fixed contest payoff functions

## The Contest

- An allocation of rewards based on performance level, $x$. Rewards determined by
- Contest payoff function, $P$, which is
function defined over the compact interval $[0, \bar{x}], \bar{x}>0$.
- $\min _{x \in[0 \overline{1} 1} P(x):=\underline{v}>0$
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## The contestant's Challenge

- Pick a non negative random performance variable, $\tilde{X}$, with associated performance distribution, $F$, to maximize $\mathbb{E}[P(\tilde{X})]$
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\mathbb{E}[\tilde{X}]=\int_{0}^{\bar{x}} x d F(x) \leq \mu
$$

## SOLUTION TO CONTESTANT'S PROBLEM

## LEMMA 1. Optimality conditions For $F$

A probability distribution function solving the contestants problem exists. For any such solution, there exist multipliers $\alpha \geq 0$ and $\beta>0$ such that the solution, $F$, satisfies the condition

$$
\begin{gathered}
P(x) \leq \alpha+\beta x \quad \forall x \geq 0 \\
d F\{x \geq 0: P(x)<\alpha+\beta x\}=0
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## VALUE MINIMIZING CONTEST DESIGNS

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## ObSERVATIONS

- The contestant's optimal strategy will exploit any convexity in the payoff schedule through randomization
- $\Rightarrow$ contestant payoff actually obtained equals the payoff against the concave majorant of the payoff function, $\hat{P}$.
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- pointwise infimum of all upper support lines of $P$
- At any performance level $x, \hat{P}(x)$ equals the maximum payoff the contestant can attain over using any random performance strategy with mean $x$
- An optimal design (designer's perspective) always produces a uniform concave upper envelope.


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# Risk taking in contest games 

## RANDOM PERFORMANCE CONTESTS

- In random performance contests, the contest payoff function is not fixed by a designer.
- Rather, it is the product of the strategies played by the contestants.
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## The contest game

- $n \geq 2$ homogeneous contestants who simultaneously choose performance distributions
- All the contestants pick a distribution, $F$, subject to only to the constraint that the distribution has non-negative support and its expectation is less than $\mu$
- There are $n$ prizes, $v_{i}$ is the value of the $i$ th prize, $v_{1} \leq \cdots \leq v_{n}$.
- Each contestant's realized performance is a draw from the performance distribution she choses.
- Prize allocation is rank-based: highest realized performance wins the $n$th prize,...
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- Equilibrium condition: Each contestant submits a performance distribution, $F$, that results in all contestants facing a uniform contest payoff function.


## EQUiLIbrium

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## BASIC PROPERTIES

LEMMA 8
Equilibrium random performance is the same for all contestants and is
a. invariant under increasing affine transformations of the prize schedule,
b. proportional to capacity, $\mu$,
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\frac{\left(v_{n}-v_{1}\right) / V}{1 / n}
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## THE BASIC CHARACTERIZATION FORMULA

## QUANTILE REPRESENTATION

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Q_{v}(p)=\frac{\mu n}{V} \sum_{i=1}^{n-1} \Delta v_{i} I_{p}(i, n-i)
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$I_{p}(i, n-i)$ Component Beta distributions with parameters $a=i$ and $b=n-i$.

# The shape of performance distributions 

## CARROTS, STICKS, AND RISKS

- Consider a contest prize schedule with three distinct prize levels and four contestants.
- A "stick" worth 0.0.
- A "hay bundle" worth 0.5
- A "carrot" worth 1.0
- Low performers receive the sticks, middling performers the hay, and top performers the carrots.
- The number of carrots and stick combined with the number of contestants determines the prize vector.
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## Sticks

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## Sticks

So how does increasing the number of sticks affect risk-taking?


## TAIL-BEHAVIOR OF PERFORMANCE DISTRIBUTIONS [PROPOSITION 3]

- Determined by the second differences of the prize schedule: roughly, second difference is positive (negative) then PDF is initially decreasing (increasing);
- if the second difference for the highest prize level with a non vanishing second difference is positive (negative) then PDF is ultimately decreasing (increasing).
- Example: Tail behavior of balanced carrot/stick contests.
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| $v$ | $(0,0,1,1)$ | $\left(0, \frac{1}{2}, \frac{1}{2}, 1\right)$ |
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| $\Delta^{2} v$ | $(1,-1)$ | $\left(-\frac{1}{2}, \frac{1}{2}\right)$ |

## CARROTS, STICKS, AND MODALITY OF CONTESTANT PERFORMANCE DISTRIBUTIONS



## Global modality

## PROPOSITION 4. QUASICONVEXITY/QUASICONCAVITY OF PDF

If the sequence of second differences of the prize schedule has at most one sign change, then equilibrium performance PDF that is either quasiconvex or quasiconcave, and thus the global behavior of the PDF is determined by its tail behavior.

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- Implication: All convex contests induce right-skewed performance distributions with decreasing PDFs, e.g.,
- Winner take all, power law, Ziph's law, Gilbrat's law contests


## Performance dispersion and the prize schedule

## DISPERSION AND INEQUALITY

## DISPERSION

Let $F$ and $G$ be two distributions. $F$ is more dispersed than $G$ in the sense of convex order if, for all convex functions, $w: \mathfrak{R}^{+} \rightarrow \Re$

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\int w(x) d F(x) \geq \int w(x) d G(x)
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## INEQUALITY

Let $x$ and $y$ be ordered nonnegative vectors $x=\left(x_{1}, \ldots, x_{n}\right), y=\left(y_{1}, \ldots, y_{n}\right)$, $x_{1} \leq \ldots \leq x_{n}, y_{1} \leq \ldots \leq y_{n}$, where $n$ is a natural number. Then $x$ majorizes $y$ if

$$
\sum_{i=1}^{k} x_{i} \leq \sum_{i=1}^{k} y_{i}, \quad \forall k \in\{1, \ldots, n-1\}, \text { and } \sum_{i=1}^{n} x_{i}=\sum_{i=1}^{n} y_{i}
$$

## REAL PRIZE INEQUALITY AND DISPERSION

- For a prize vector $v=\left(v_{1}, \ldots, v_{n}\right)$, define its normalized real gain vector as

$$
\bar{v}^{r}=\left(\bar{v}_{1}^{r}, \ldots, \bar{v}_{n}^{r}\right)=\left(\frac{v_{1}-v_{1}}{\sum_{i=1}^{n}\left(v_{i}-v_{1}\right)}, \ldots, \frac{v_{n}-v_{1}}{\sum_{i=1}^{n}\left(v_{i}-v_{1}\right)}\right) .
$$

- Increasing the inequality of the normalized real gains offered by the prize schedule, always increases the dispersion of equilibrium performance distribution.

Let $v$ and $u$ be two prize schedules
$\vec{v}^{n}$ majorizes $\vec{u}^{n} \Rightarrow F_{v}$ is more dispersed than $F_{u}$.

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## Proposition 5. Prize in equality $\Rightarrow$ PERFORMANCE DISPERSION

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## ObSERVATION: "REAL" IS REAL IMPORTANT

- Reducing the inequality of the (nominal) prize schedule can increase the dispersion of the performance distribution:
- Example: Ultra-robin hood transfer from the highest prize to the lowest prize:
$\square$
- $v$ majorizes $v_{\mathrm{uRH}}$ but $\bar{v}_{\mathrm{uRH}}^{r}$ majorizes $\bar{v}^{r}$


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| $v$ | $(1,2,3,4)$ | $(13 / 4,2,3,31 / 4)$ |
| $\bar{v}^{r}$ | $\left(0, \frac{1}{6}, \frac{1}{3}, \frac{1}{2}\right)$ | $\left(0, \frac{1}{12}, \frac{5}{12}, \frac{1}{2}\right)$ |

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## REAL NOT NOMINAL INEQUALITY MATTERS

- The ultra-RobinHood transfer reduces nominal prize inequality, measured by Lorentz curve of the prize vector
- The ultra-RobinHood transfer increases real prize inequality, measured by the Lorentz curve for normalized real gains.
- Increase in real prize inequality leads to more performance dispersion, i.e., more risk taking.



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## Effect of contest size on risk taking

## EfFECT OF NEW ENTRANTS

- Adding a matching number of new entrants and minimum prizes to a contest increases real prize inequality.
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Up scaling contest size does not affect real prize inequality.

## Effect of $s$-FOLD SCALING OF THE PRIZE SCHEDULE

Up scaling contest size does not affect real prize inequality. Thus, no effect on Lorentz curve


SkEWING THE OddS

## Scaling in the limit

- As the scaling factor increases without limit, the performance distribution converges to a discrete distribution whose support is determined by the number of non-vanishing prize differences of the original prize schedule.
- Even when the scaling factor is modest, the clustering of performance around the limit points is quite apparent.


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## The skewness of performance distributions

## Skewness: DEFInitions

## VANZWET SKEWNESS ORDER

Let $F$ and $G$ be two CDFs, both of which are strictly increasing and twice continuously differentiable on the corresponding support. The distribution $G$ is more skewed to the right (left) than $F$ in the sense of (Zwet, 1964) if and only if $G^{-1} \circ F$ is convex (concave) on the support of $F$.

A function $h: \Re \rightarrow \Re$ is a prize value transformation function if it is nondecreasing. The prize value transformation of prize vector $v$ generated by

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## PRIZE VALUE TRANSFORMATION FUNCTION

A function $h: \Re \rightarrow \Re$ is a prize value transformation function if it is nondecreasing. The prize value transformation of prize vector $v$ generated by $h$, which we represent by $v^{h}$, is defined by $v_{i}^{h}=h\left(v_{i}\right)$ for all $i \in\{1, \ldots, n\}$.

## Skewness: Result

## CONVEX TRANSFORMATION INCREASE SKEWNESS

If $h$ is a prize value transformation function, then the following two statements are equivalent:

- $h$ is convex
- for all prize schedules, the equilibrium performance distribution under $v^{h}$ is more skewed to the right in than the equilibrium performance distribution under $v$.


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## EfFECT OF CONVEX TRANSFORMATIONS: EXAMPLE

- Consider the power law (coefficient .50) prize schedule for a contest with eight prizes:

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v_{p}(i)=(n+1-i)^{-1 / 2}, \quad i=1,2 \ldots 8 .
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- $h$ is convex, so the difference ratio $i \rightarrow \Delta v_{p}^{h}(i) / \Delta v_{p}(i)$ is increasing



## Effect of convex transformations: Example

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$$

- Apply the transformation $h(x)=x^{2}$ to $v_{p}$ to produce $v_{p}^{h}$.
- The convex transformation increases right skewness of the performance distribution



## Predictions

- Given Chevalier and Ellison (1997) and Chevalier and Ellison (1999)
- Young fund managers should exhibit skewness aversion
- Senior managers should exhibit skewness preference
- Firms offering Executive compensation packages that feature a high CEO Pay Slice (Bebchuk, Cremers and Peyer, 2011) will exhibit higher unsystematic revenue volatility.
- Industries with significant network externalities (thus winner-take-all dynamics) should have more skewed and volatile revenues.


## Predictions

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## Thank you for your time!

## MULTIPLE CONTESTANTS $>2$ ALSO MATTER

- In an all-pay auction, but not a rank-based contest game, a bidder has a walk-away option: the bidder can walk away from the auction and keep his wealth intact.
- When there only two bidders, it is never optimal for a bidder to exercise the walk-away option
- In the two bidder case, an isomorphism can be established between all pay auction equilibria and random performance contest equilibria.
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## UNIFORM EQUILIBRIUM CONTEST PAYOFF FUNCTION

- The uniform bound puts a floor on $\bar{x}$
- The equilibrium condition that $\bar{x}$ is a best response puts a ceiling on $\bar{x}$
- The floor and the ceiling are the same.
- The ceiling can only be reached if the concave majorant of the contest payout function is uniform.
- So, the concave majorant of the contest payoff function is uniform with upper bound, $\bar{x}$.
- If the contest payoff function breaks contact with its concave majorant at any performance level, that performance level is not a best response and so will not be played.
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## EQUILIBRIUM CONDITIONS ON DISTRIBUTIONS

## EQUILIBRIUM DISTRIBUTION EQUATION

There exists a unique equilibrium. In this equilibrium, every contestant chooses the same performance distribution. If $F_{v}$ represents the equilibrium performance distribution associated with prize schedule $v$, then $\operatorname{Supp}\left\{F_{v}\right\}=\left[0, \mu n\left(v_{n}-v_{1}\right) / V\right]$, where

$$
\begin{equation*}
V=\sum_{i=1}^{n}\left(v_{i}-v_{1}\right), \tag{1}
\end{equation*}
$$

and, over $\operatorname{Supp}\left\{F_{v}\right\}, F_{v}$ is uniquely determined by

$$
\sum_{i=0}^{n-1}\left(v_{i+1}-v_{1}\right)\binom{n-1}{i} F_{v}(x)^{i}\left(1-F_{v}(x)\right)^{n-1-i}=\frac{V}{\mu n} x .
$$

## QUANTILE REPRESENTATIONS

## QUANTILE FUNCTION

$$
\begin{aligned}
& Q_{v}(p)=\frac{\mu n}{V} \sum_{i=0}^{n-1}\left(v_{i+1}-v_{1}\right)\binom{n-1}{i} p^{i}(1-p)^{n-1-i} . \\
& Q_{v}(p)=\frac{\mu n}{V} \sum_{i=1}^{n-1} \Delta v_{i} I_{p}(i, n-i)
\end{aligned}
$$

## Quantile representations (cont.)

## QUANTILE DENSITY

$$
q_{v}(p)=\frac{\mu n(n-1)}{V}\left(\sum_{i=0}^{n-2} \Delta v_{i+1}\binom{n-2}{i} p^{i}(1-p)^{n-2-i}\right) .
$$



## QUANTILE REPRESENTATIONS (CONT.)

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$$
q_{v}(p)=\frac{\mu n(n-1)}{V}\left(\sum_{i=0}^{n-2} \Delta v_{i+1}\binom{n-2}{i} p^{i}(1-p)^{n-2-i}\right) .
$$

## DERIVATIVE OF QUANTILE DENSITY

$$
q_{v}^{\prime}(p)=\frac{\mu n(n-1)}{V}\left(\sum_{i=0}^{n-3}\left(\Delta v_{i+2}-\Delta v_{i+1}\right)\binom{n-2}{i}(n-2-i) p^{i}(1-p)^{n-3-i}\right)
$$

## PARAMETERS

$$
\begin{aligned}
& \text { Entrants: } v=(0,0, \overbrace{1, \ldots, 1}^{4}, \overbrace{3, \ldots, 3}^{4}) \\
& v^{e}=(0,0,0, \overbrace{1, \ldots, 1}^{4}, \overbrace{3, \ldots, 3}^{4}) \\
& \text { Scaling : } v^{\times 2}=(\overbrace{1, \ldots, 1}^{4}, \overbrace{1, \ldots, 1}^{8}, \overbrace{3, \ldots, 3}^{8}) \\
& \text { Clustering: } v^{\times 2}=(0,0, \overbrace{1, \ldots, 1}^{4}, \overbrace{3, \ldots 3}^{4}, 5,5) \\
& \text { Clustering : } \\
& v^{\times 8}=(\overbrace{0, \ldots 0}^{8}, \overbrace{1, \ldots 1,3}^{16}, \overbrace{3, \ldots 3}^{16}, \overbrace{5, \ldots 5}^{8})
\end{aligned}
$$

